

Maya: Next Generation Modeling & Simulation Tools for Global Networks

UCLA: R. Bagrodia, M. Gerla, S. Lu, F. Paganini,
M. Sanadidi, M. Takai

Caltech: J. Doyle, S. Low

DARPA PI Meeting, October, 2001
Atlanta

Impact

- A *multi-paradigm* integrated framework for network performance analysis: **Maya**
- A novel theory of network control and stability: **HOT and FAST**
- Adaptive network control using real-time simulations

Paganini,
Low, Doyle

Stability

Bagrodia,
Gerla, Lu

Performance

Information
Theory

Computational
**Theory of
Complex systems?**
Complexity

Dynamical
Systems

Statistical
Physics

dimension

∞

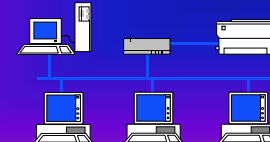
Maya -- UCLA Computer Science

Fluid Flow Models	Analytical Models	Abstract Simulation	Packet-Level Simulation	Operational Software
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Virtual Time Synchronization Algorithms

Parallel Execution

Sequential



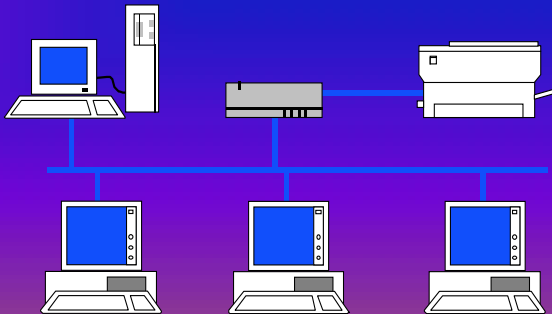
Maya: Multi-Paradigm Network Modeling

Fluid Flow Models **Analytical Models** **Abstract Simulation** **Detailed Simulation** **Operational Software**

Virtual Time Synchronization Algorithms

Parallel Execution

Sequential





Multi-Paradigm Network Modeling

- Motivation

- Achieve appropriate **balance** between
 - model **development** time,
 - model **accuracy**, and
 - model **solution** time
- Provides an appropriate **validation** environment
- Promotes easier **extensibility** of models

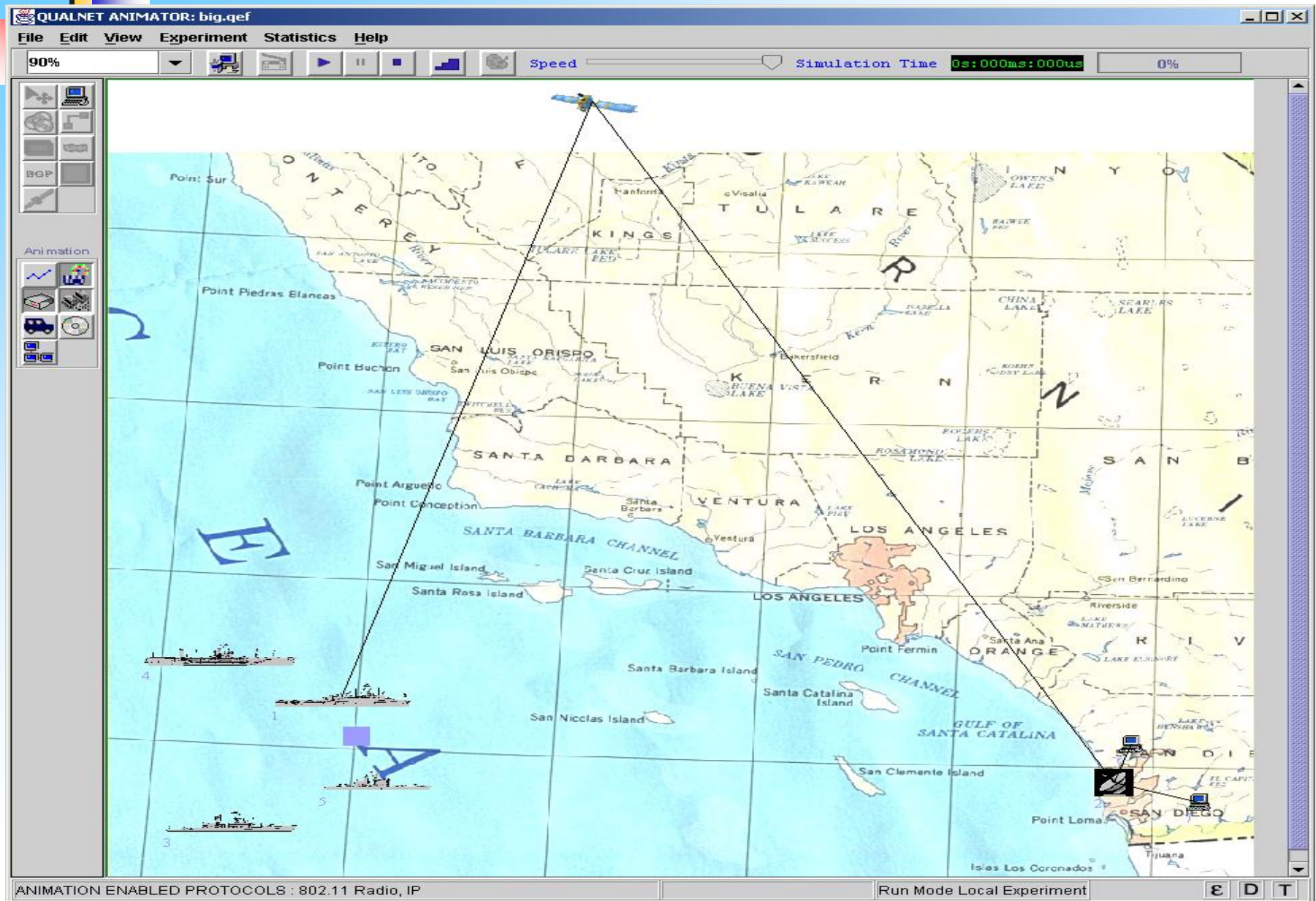


Accomplishments (Packet Level Simulations)

Simulate realistic Naval scenarios with 65 objects, up to **10x** faster than existing **COTS** tools

- Simulate networks that are **100x larger** than can be simulated using existing COTS tools.
- **Accurate** simulation of ad hoc networks with **100s of radios faster than real time** and **detailed simulation of networks with up to 10,000 communication devices.**
- Technology **commercialized** into **QualNet**; in use by DoD units including **US Army CECOM**, **US Navy SPAWAR**, and **Future Combat System (FCS)** to design and analyze next generation military comm networks.

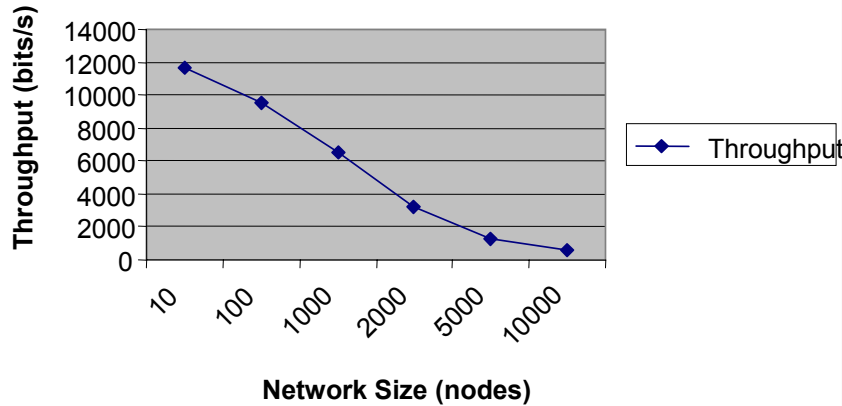
SPAWAR: QualNet Model of Link-16 radios



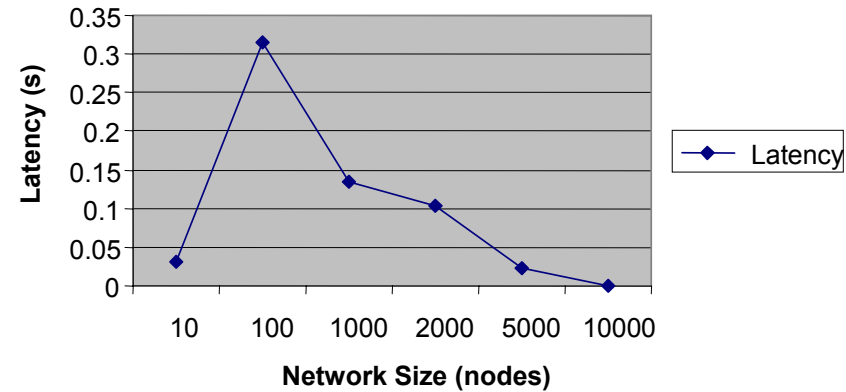
CECOM: Large Ad hoc network simulation: 10,000 nodes

nodes

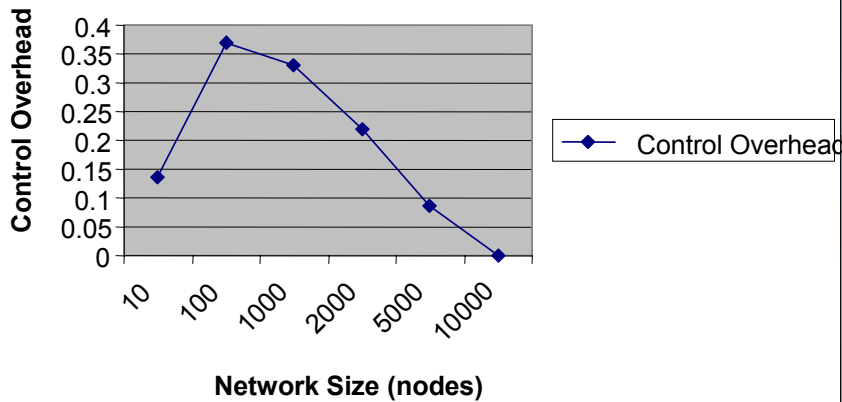
Throughput vs. Network Size



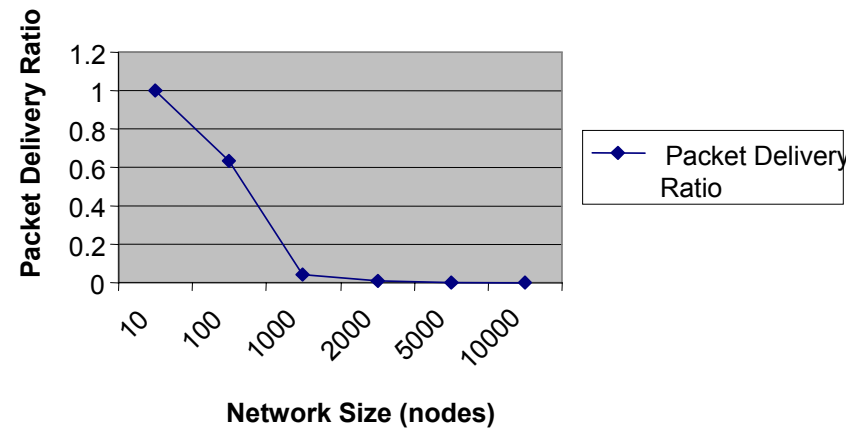
Latency vs. Network Size



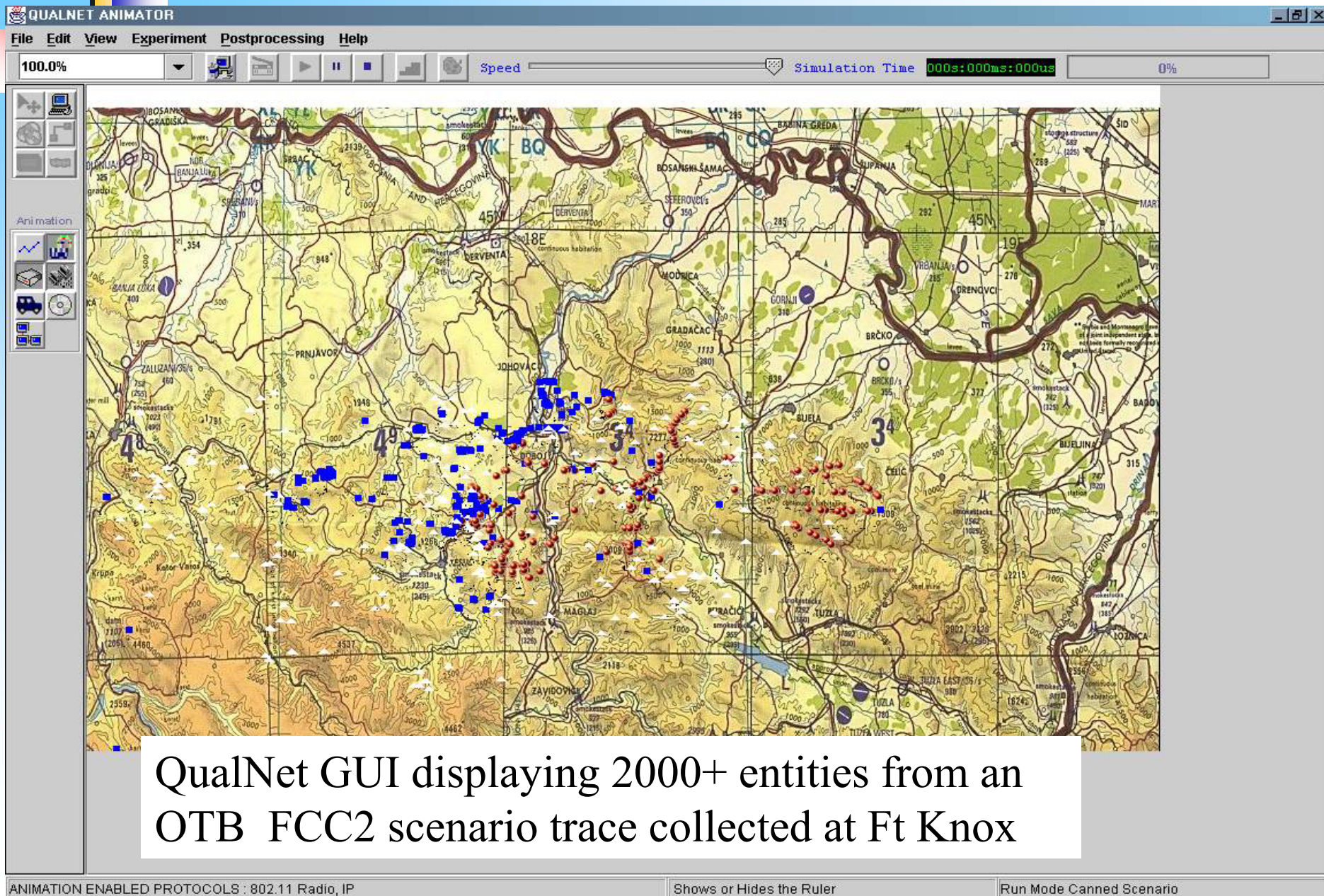
Control Overhead vs. Network Size



Packet Delivery Ratio vs. Network Size



CECOM: Integration with WarGaming





Accomplishments (Multi-Paradigm Modeling)

- Integration of **fluid-flow models** and detailed **packet level simulations** for TCP Westwood (Demo 1)
 - **Joint work with Gerla & Paganini**
- Integration of **fluid-flow models** with packet-level simulators **NS-2** and **QualNet** (Demo 2)
 - **Joint work with Amherst & Georgia Tech**
- Integration of **operational software** with detailed **packet-level simulation** for distributed applications, using both **sequential** and **parallel** execution
- Extended **backplane design** to directly integrate fluid flow models, discrete-event simulation & operational software



Talk Overview

- Multi-paradigm modeling of TCP Westwood
 - Analytical model based on fluid flow concept
 - Discrete event model based on operational codes
 - Hybrid model that integrate two different modeling paradigms
- Multi-paradigm modeling framework
 - Multiple simulators and analytical models connected via backplane
 - Demonstration overview
- Work in progress with timeframes



TCP Westwood

TCP Westwood (TCPW) controls the window size based on BSE (Bandwidth Share Estimation)

When three duplicate ACKs are detected:

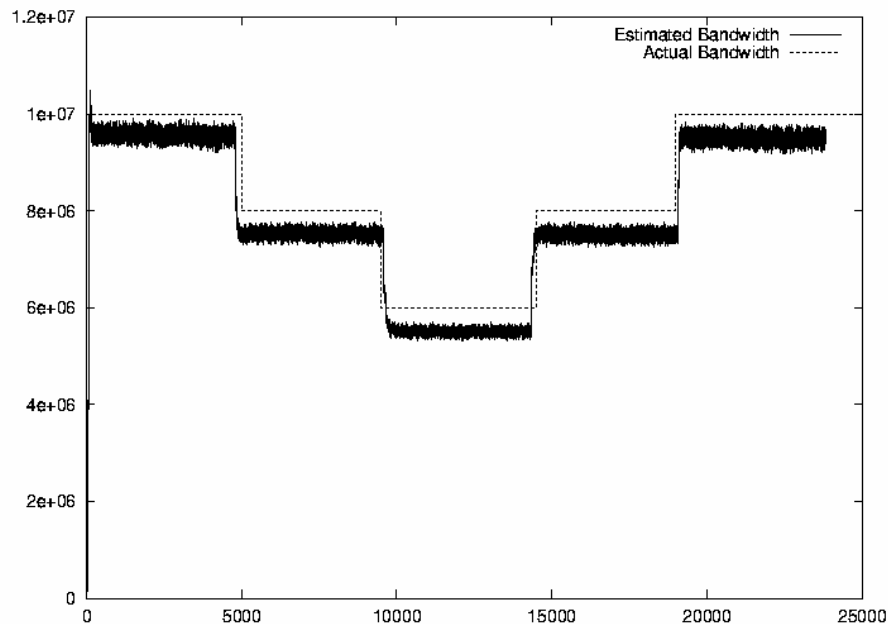
- `set ssthresh=BE*RTT`
(instead of `ssthresh=cwin/2` as in Reno)
- `if (cwin > ssthresh) set cwin=ssthresh`

When a TIMEOUT expires:

- `set ssthresh=BE*RTT; set cwin=1 ;`
(instead of `ssthresh=cwnd/2` as in Reno)

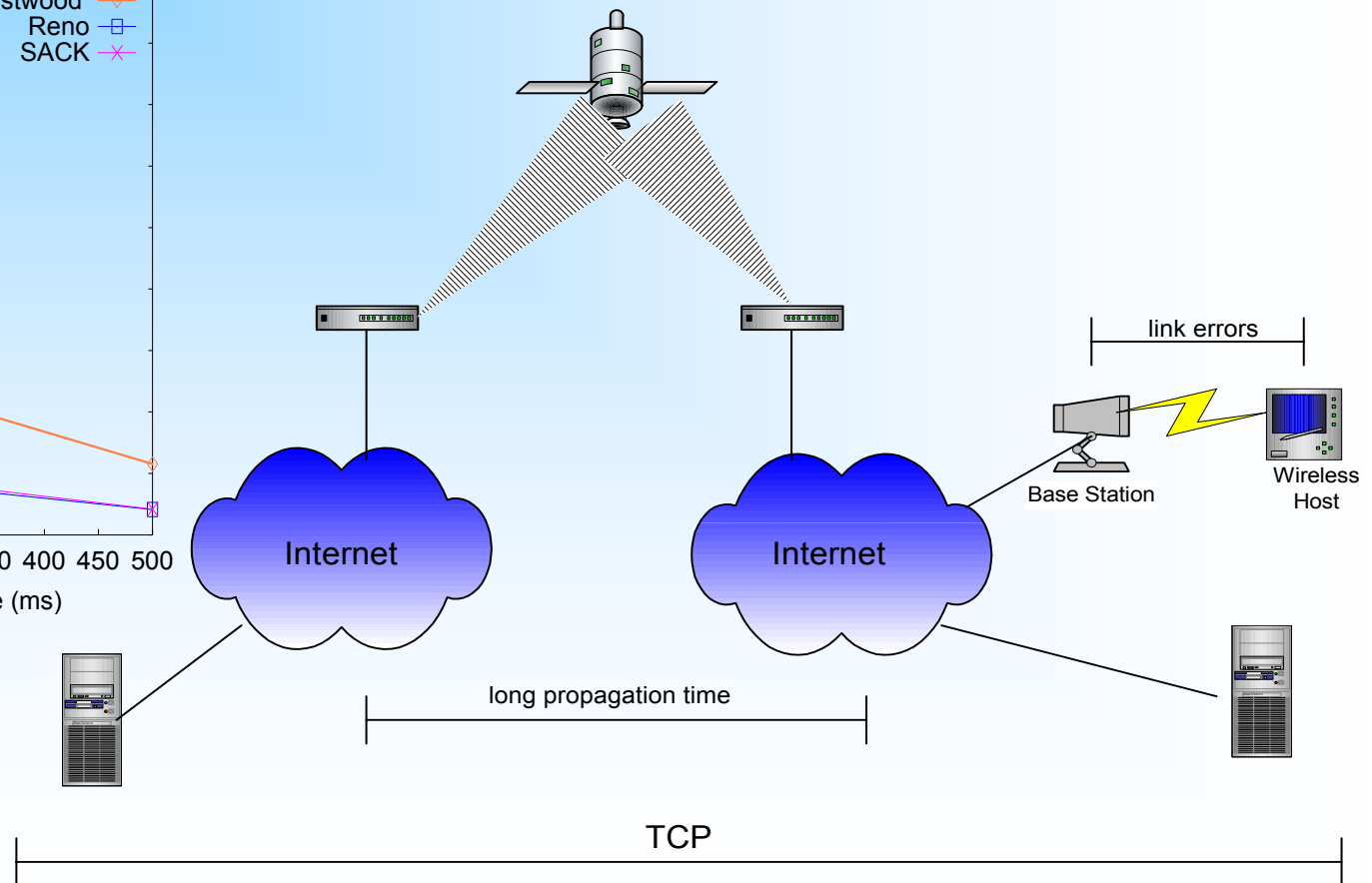
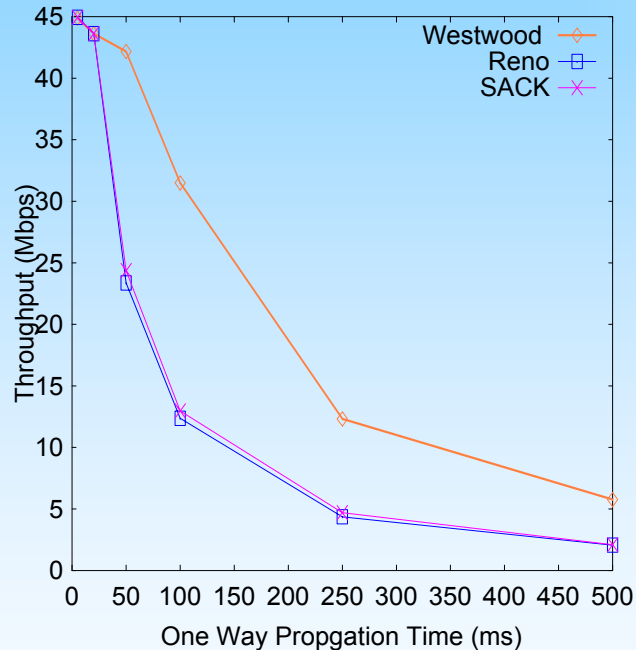
Bandwidth Estimation in TCP Westwood

- Estimates Are Determined at TCP Sender Via Sampling and Exponential Filtering Techniques
- Bandwidth Samples Are Determined from ACK Arrival Process and Info Carried in ACKs
- BSE of TCP Westwood with UDP traffic



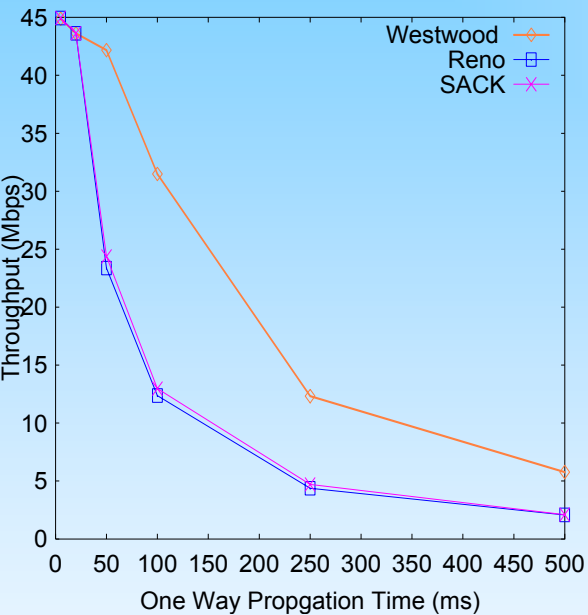
TCP Westwood

- Performance improvements shown for TCP-westwood in links with high loss probability or long delays

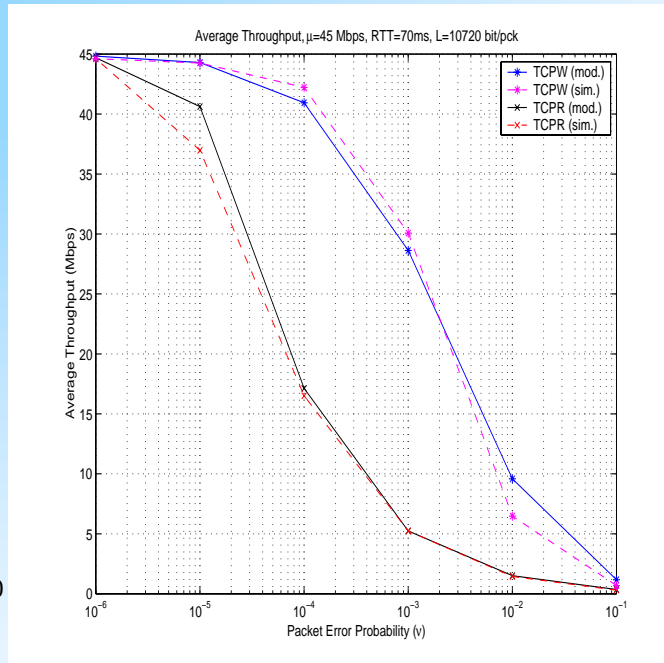


Initial Performance

Performance Evaluation (2)

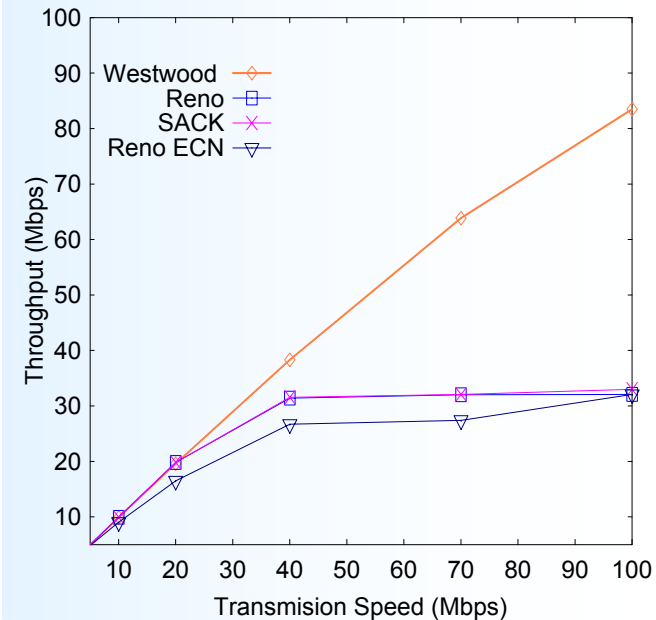


Simulation



Analysis Validated By
Simulation

45Mb/s link; 70 msec RTT;
Router Buffer Size=294 (=Pipe Size)



Simulation

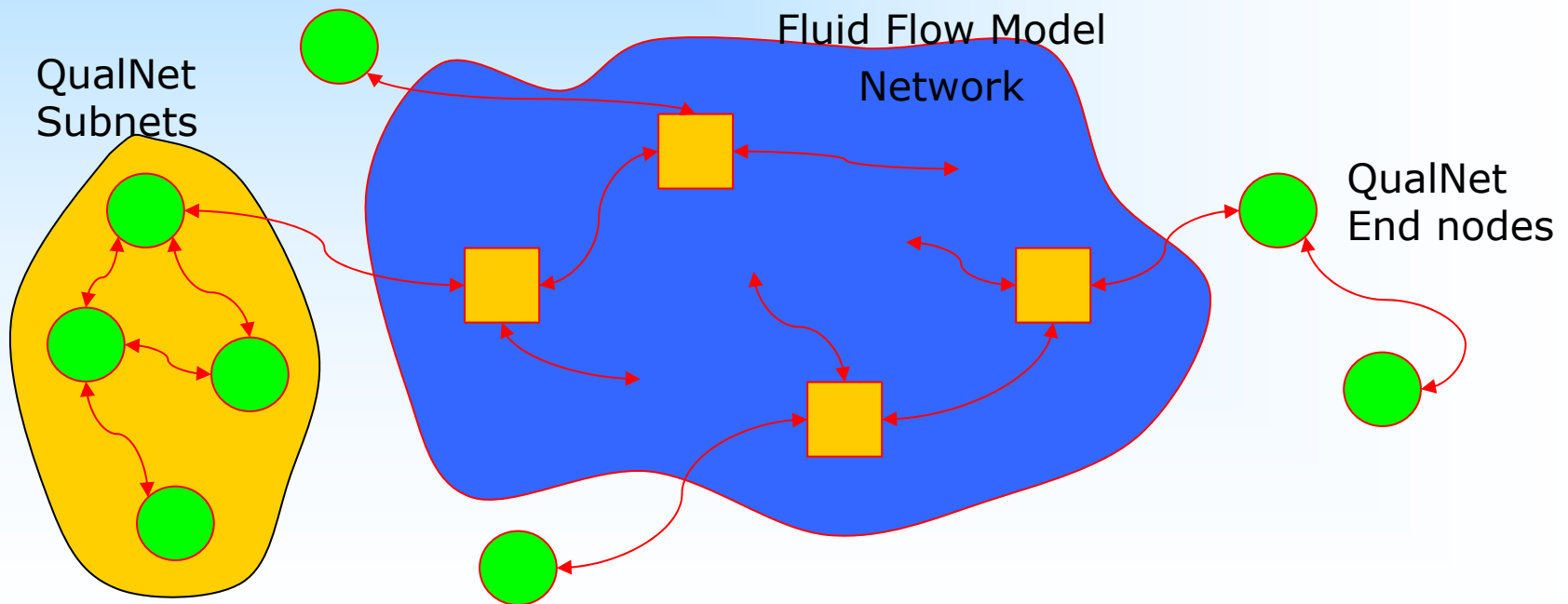


TCP Westwood -- Modeling

- TCP Westwood implemented in QualNet as a variant of TCP models
- Original QualNet TCP models are derived from operational TCP (FreeBSD) codes: validated (highest fidelity)
- Analytical model developed by Paganini et al
- Simulation model by Gerla, Sanadidi, et al
- Mixed analytical-simulation model by Takai, et al

Integration of TCPW Analytical Model and Packet Level Simulator

- Allows more scalability compared to pure packet level simulation
- Designates a wired sub-network of routers to be simulated using analytical model (fluid-flow model)
- Other subnets and nodes are simulated by packet-level simulator (QualNet)



TCP Westwood Analytical Model

■ Notations:

- $W_i(t)$, $R_i(t)$ - Window size and round trip time of i th TCP connection
- $b_i(t)$ - Estimated Bandwidth of i th TCP connection
- $q(t)/C$ - Queueing delay at congested router
- $p(x)$ - loss function for AQM policy
- τ - one round trip delay

TCP Reno

$$\frac{d\bar{W}_i}{dt} = \frac{1}{R_i(\bar{q})} - \frac{\bar{W}_i \bar{W}_i(t - \tau)}{2R_i(\bar{q}(t - \tau))} p(x(t - \tau))$$

TCP W'wood

$$\frac{d\bar{W}_i}{dt} = \frac{1}{R_i(\bar{q})} - \frac{\bar{W}_i(t - \tau)}{R_i(\bar{q}(t - \tau))} p(x(t - \tau)) [\bar{W}_i - a_i \cdot \bar{b}_i(t)]$$

■ Window size of i th TCP Connection:

■ Queue Length estimate:

$$\frac{d\bar{q}}{dt} = -C + \sum_{i=1}^N \frac{\bar{W}_i}{R_i(\bar{q})}$$

■ Average Queue Length is an exponential average:

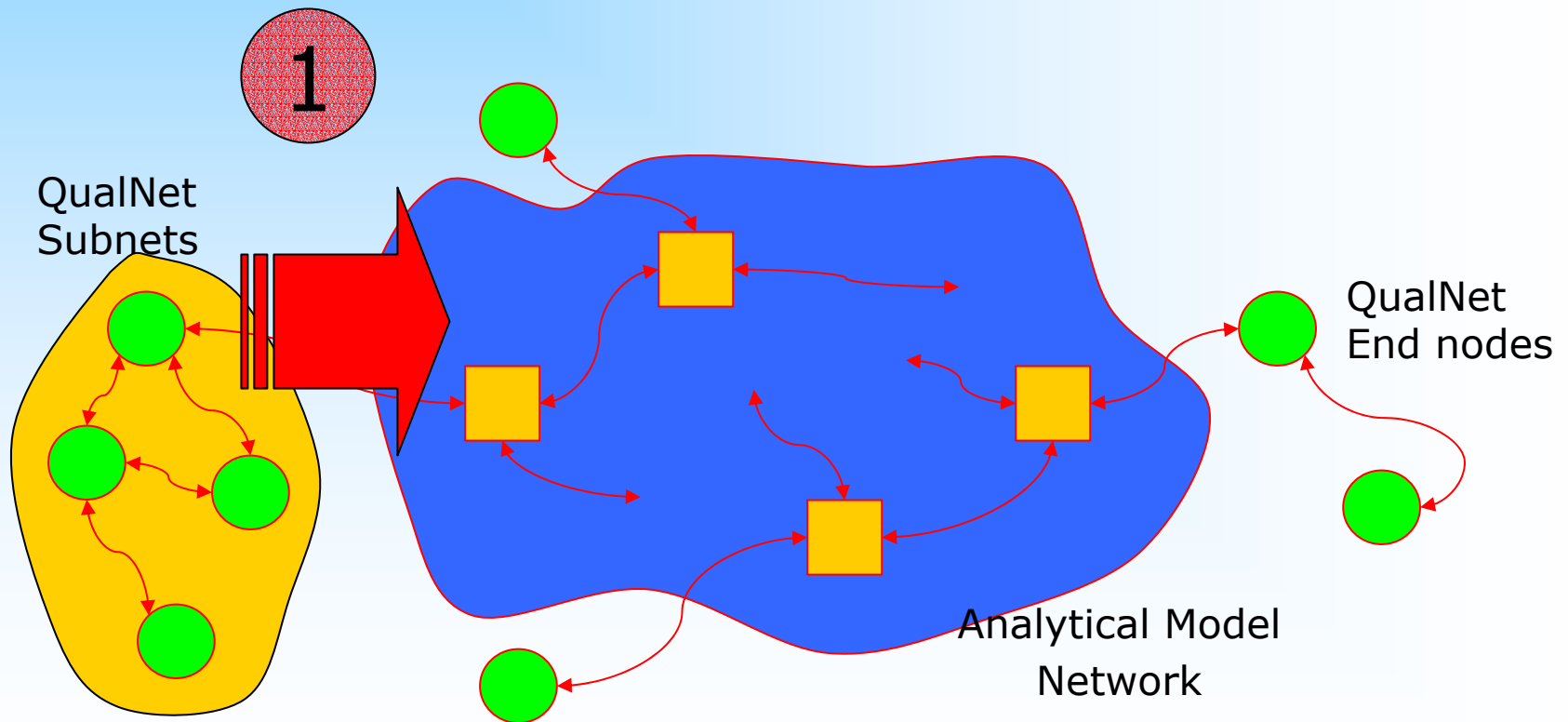
$$\frac{dx}{dt} = \frac{\ln(1 - \alpha)}{\delta} \bar{x}(t) - \frac{\ln(1 - \alpha)}{\delta} \bar{q}(t)$$

■ Bandwidth Estimation for the i th TCP Connection:

$$\frac{d\bar{b}_i}{dt} = \frac{1}{T} \cdot \frac{\bar{W}_i(t - \tau)}{R_i(\bar{q})} - \frac{1}{T} \bar{b}_i(t)$$

Integration Steps (1)

1. For each link from QualNet nodes to analytical section, packets entering the section will be accumulated as input data rates in each time interval:



Integration Steps (2)

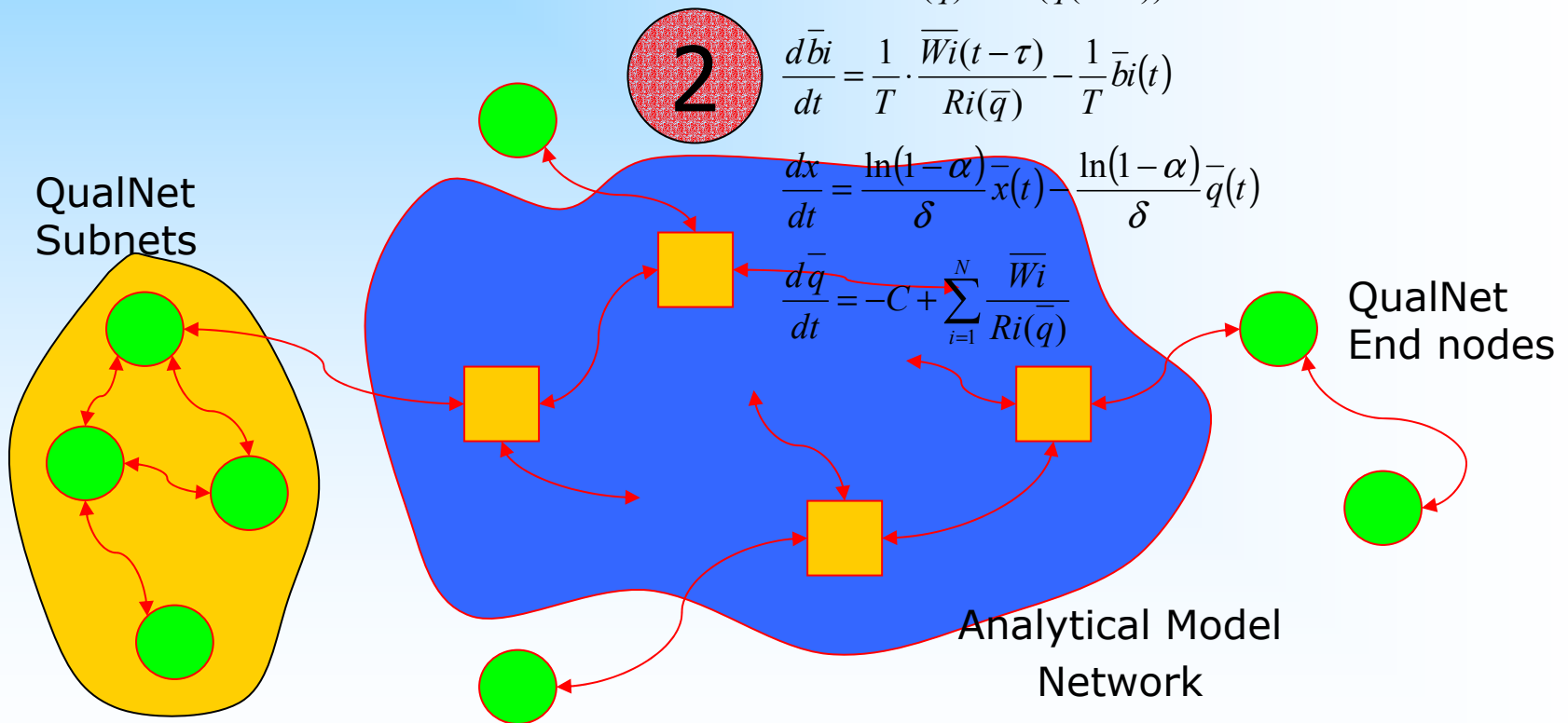
2. The analytical model will solve differential equations to obtain network parameters such as queue lengths of routers:

$$\frac{d\bar{W}_i}{dt} = \frac{1}{R_i(\bar{q})} - \frac{\bar{W}_i(t-\tau)}{R_i(\bar{q}(t-\tau))} p(x(t-\tau)) [\bar{W}_i - a_i \cdot \bar{b}_i(t)]$$

$$\frac{d\bar{b}_i}{dt} = \frac{1}{T} \cdot \frac{\bar{W}_i(t-\tau)}{R_i(\bar{q})} - \frac{1}{T} \bar{b}_i(t)$$

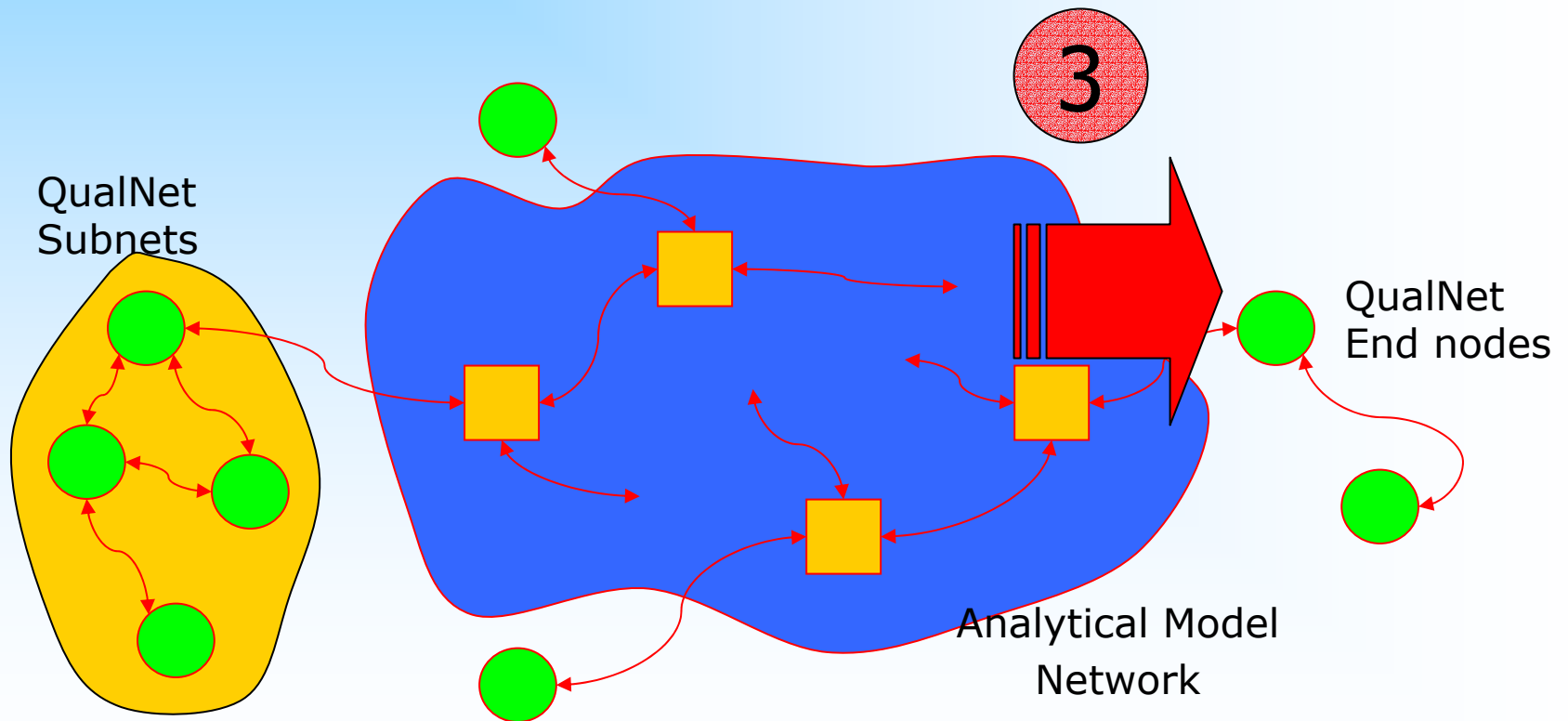
$$\frac{dx}{dt} = \frac{\ln(1-\alpha)}{\delta} x(t) - \frac{\ln(1-\alpha)}{\delta} \bar{q}(t)$$

$$\frac{d\bar{q}}{dt} = -C + \sum_{i=1}^N \frac{\bar{W}_i}{R_i(\bar{q})}$$



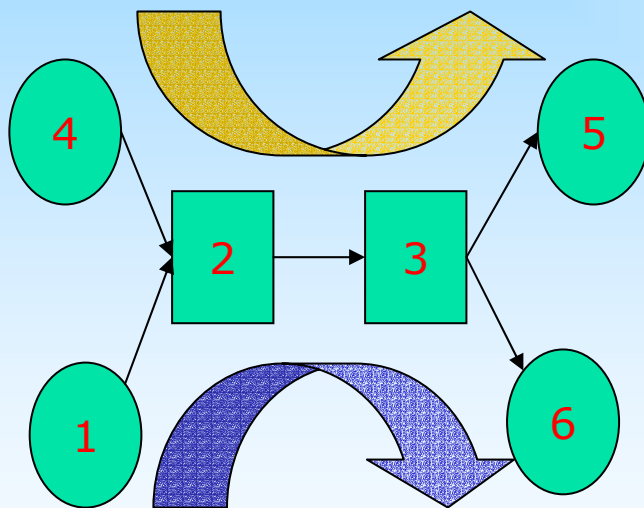
Integration Steps (3)

3. QualNet will estimate delays for each packet based on router queue lengths, then schedule packet arrival events at exit nodes at other side of analytical section:

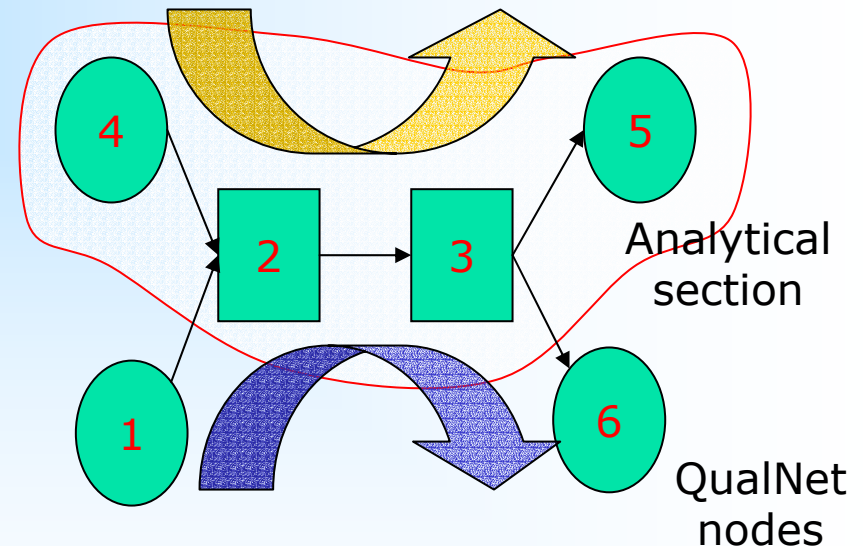


Network Topology for Experiment

- QualNet nodes: 1, 6; Analytical section: nodes 2,3,4,5
- Analytical model Connection: Node 4 → Node 2 → Node 3 → Node 5
- QualNet Connection: Node 1 → Node 2 → Node 3 → Node 6
- Link between nodes 2 and 3 will be bottleneck



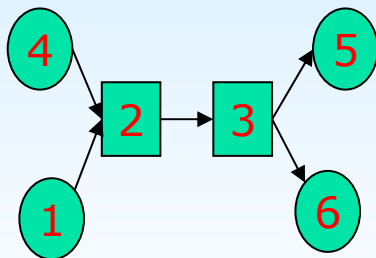
**Pure Discrete Event
Simulation**



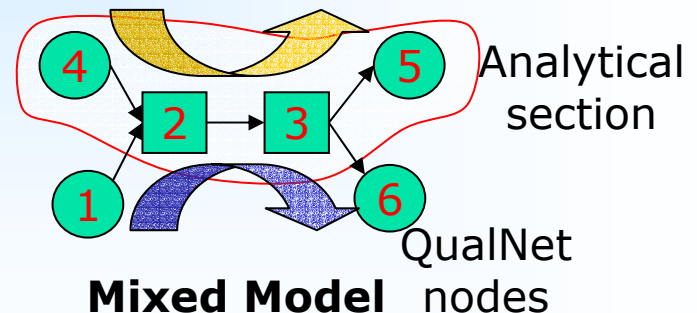
**Mixed Model
Simulation**

Validation

- Connections:
 - 20 TCP Westwood connections from nodes 4 to 5
 - 1 TCP Westwood connection from nodes 1 to 6
- To observe:
 - Comparable transient and average queue lengths at a specific node for both models



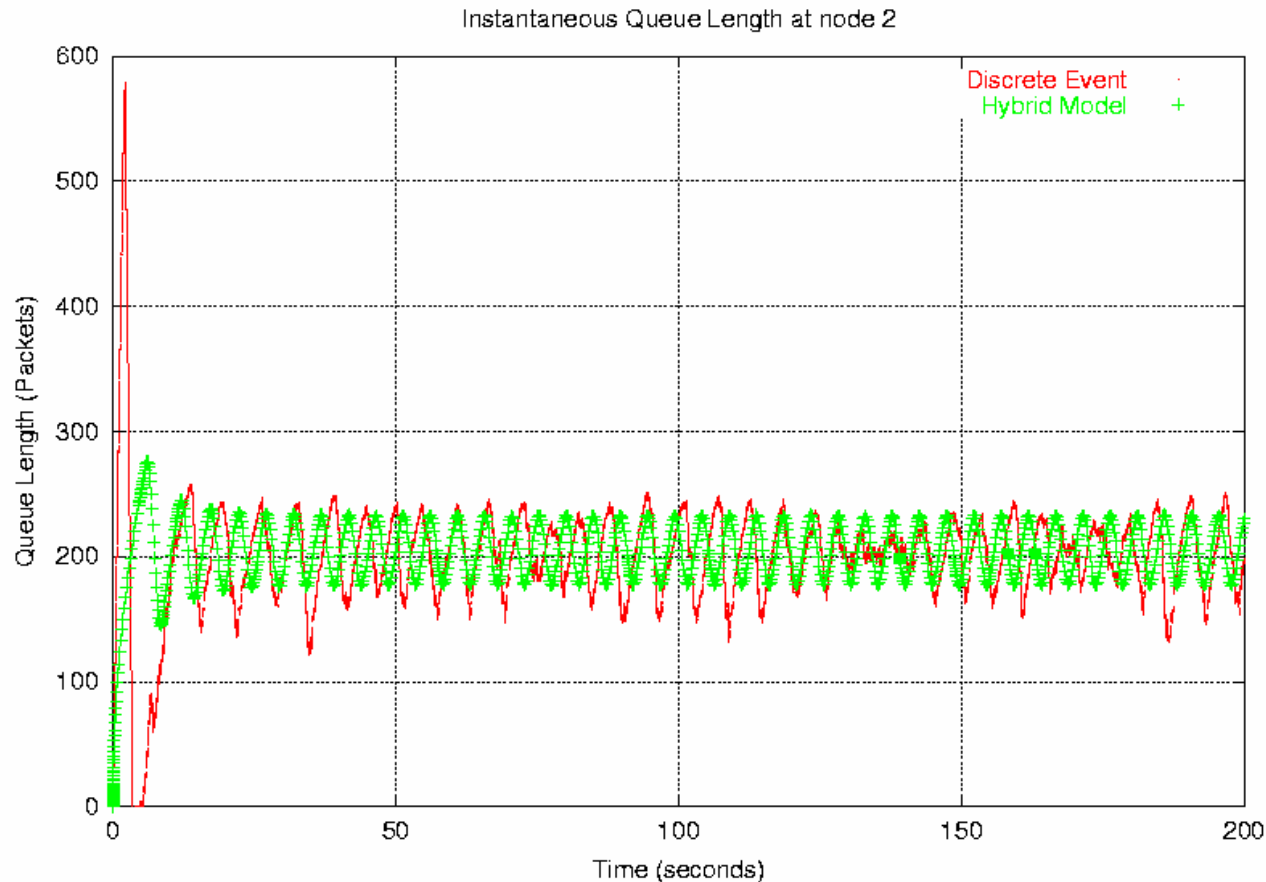
**Pure Discrete Event
Simulation**



**Mixed Model
Simulation**

Validation (2)

- The oscillations stabilize quickly
- Both models produce almost the same average queue lengths over a short period of time

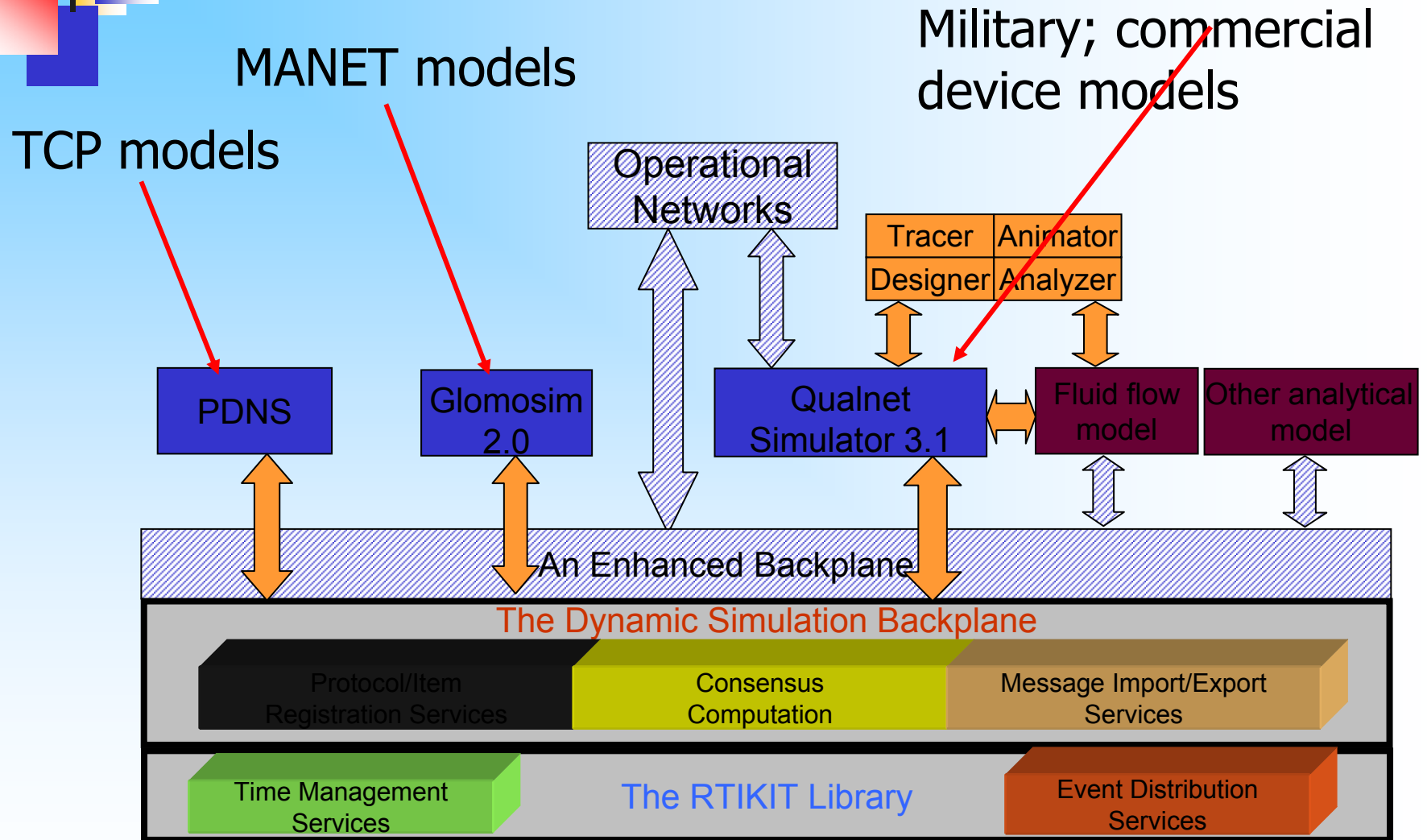




Validation (3)

- Greater differences at the beginning of the simulation
 - This is due to the lack of slow start for the analytical model
- After a few seconds, the oscillations stabilize and both curves look similar
 - Both models produce almost the same average queue lengths over a short period of time
 - This shows that analytical model makes quite good predictions

Multi-Paradigm Modeling Framework

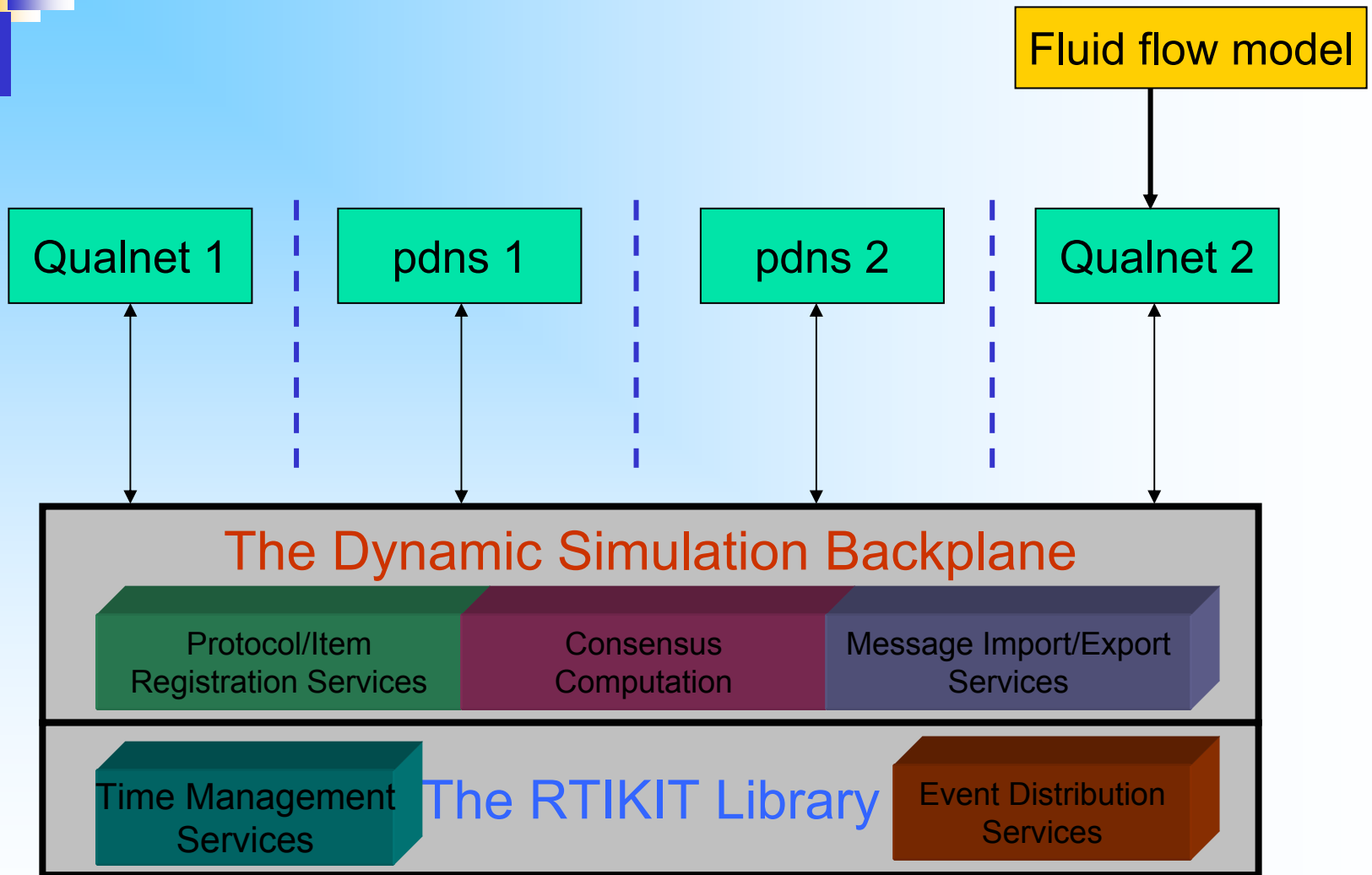




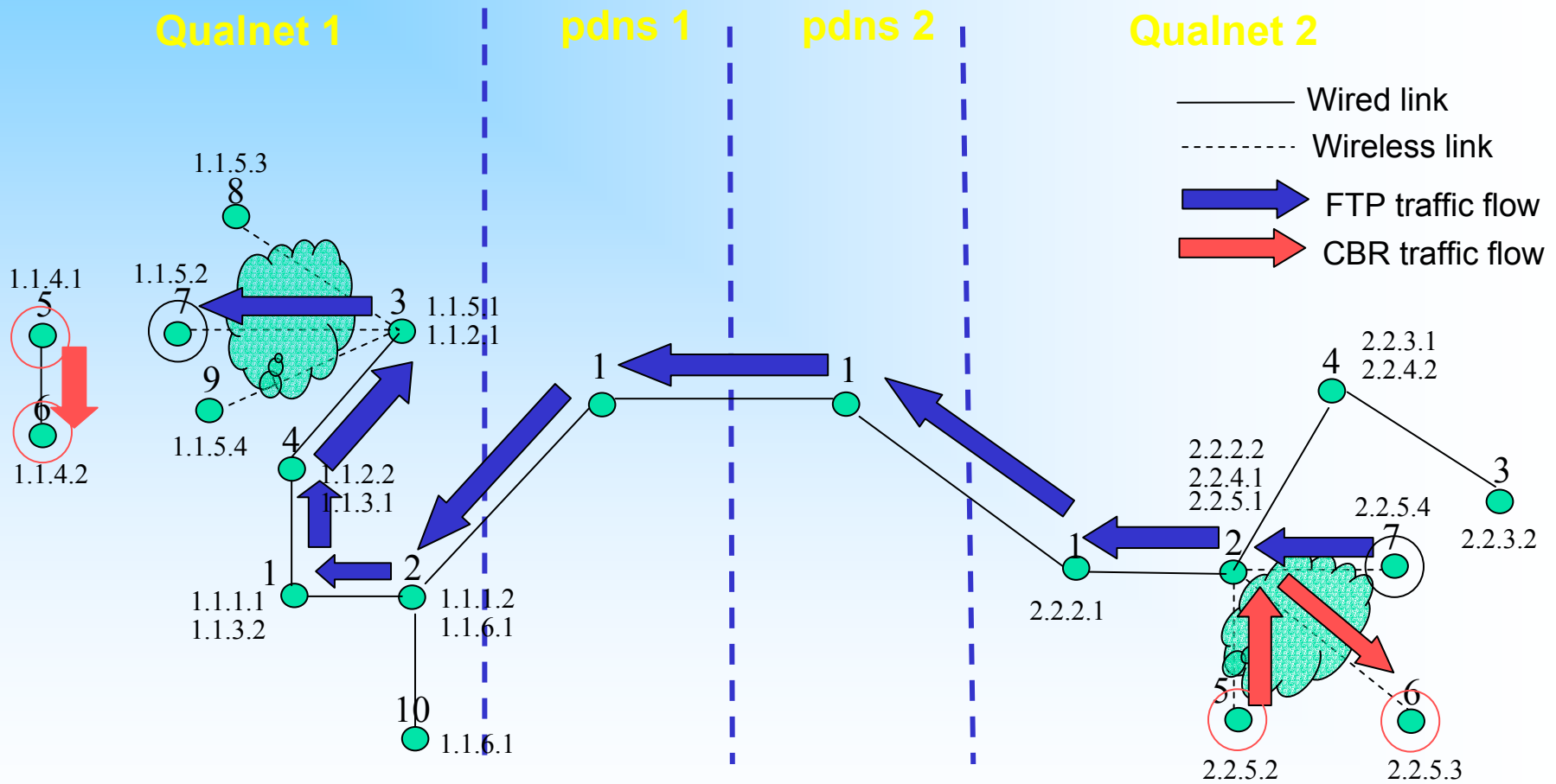
Distributed Network Simulation: Approach

- Partition the network to be simulated into sub-networks.
- Each sub-network is simulated by one simulator instance.
- The simulator instances are inter-connected via a dynamic simulation backplane
- The simulator instances exchange messages at runtime through the backplane to model packet transmissions across sub-networks.

Current Implementation



Demo Overview





Future Work

- Hybrid model (mix of analytical and discrete event models) has been implemented and verified with pure discrete event models
 - Extend model to derive end-end latency & throughput
 - Extend model to networks with hundreds of flows
 - Generalize interface to incorporate diverse fluid flow models
 - Extend model to incorporate parallel DES
- Multi-Paradigm modeling Environment
 - An enhanced dynamic simulation backplane that supports more generic network topologies
 - Incorporation of analytical network modeling tools such as fluid flow based TCP models
 - Incorporation of operational software